AFRL-IF-RS-TR-2006-10 Final Technical Report January 2006



# BENCHMARKING AND ANALYSIS OF HIGH PRODUCTIVITY COMPUTING (HPCS)

**University of Tennessee** 

Sponsored by Defense Advanced Research Projects Agency DARPA Order No. Q600

APPROVED FOR PUBLIC RELEASE; DISTRIBUTION UNLIMITED.

The views and conclusions contained in this document are those of the authors and should not be interpreted as necessarily representing the official policies, either expressed or implied, of the Defense Advanced Research Projects Agency or the U.S. Government.

AIR FORCE RESEARCH LABORATORY INFORMATION DIRECTORATE ROME RESEARCH SITE ROME, NEW YORK

### STINFO FINAL REPORT

This report has been reviewed by the Air Force Research Laboratory, Information Directorate, Public Affairs Office (IFOIPA) and is releasable to the National Technical Information Service (NTIS). At NTIS it will be releasable to the general public, including foreign nations.

AFRL-IF-RS-TR-2006-10 has been reviewed and is approved for publication

APPROVED: /s/

CHRISTOPHER J. FLYNN Project Engineer

FOR THE DIRECTOR: /s/

JAMES A. COLLINS, Deputy Chief Advanced Computing Division Information Directorate

# REPORT DOCUMENTATION PAGE

Form Approved OMB No. 074-0188

Public reporting burden for this collection of information is estimated to average 1 hour per response, including the time for reviewing instructions, searching existing data sources, gathering and maintaining the data needed, and completing and reviewing this collection of information. Send comments regarding this burden estimate or any other aspect of this collection of information, including suggestions for reducing this burden to Washington Headquarters Services, Directorate for Information Operations and Reports, 1215 Jefferson Davis Highway, Suite 1204, Arlington, VA 22202-4302, and to the Office of Management and Budget, Paperwork Reduction Project (0704-0188), Washington, DC 20503

1. AGENCY USE ONLY (Leave blank)	2. REPORT DATE	3. REPORT TYPE AND	ND DATES COVERED		
	JANUARY 2006		Final May 04 – Oct 05		
4. TITLE AND SUBTITLE			5. FUNDING NUMBERS		
BENCHMARKING AND ANALYSIS OF HIGH PRODUCTIVITY COMPUTING		C - FA8750-04-1-0219			
(HPCS)			PE - N/A		
			PR - HPCS		
O AUTHOR(O)			TA - 00		
6. AUTHOR(S) Jack Dongarra and			WU - TC		
Piotr Luszczek					
Plott Luszczek					
7. PERFORMING ORGANIZATION NAME(S) AND ADDRESS(ES)			8. PERFORMI	NG ORGANIZATION	
University of Tennessee			REPORT NUMBER		
1122 Volunteer Blvd					
Knoxville Tennessee 37996-3450					
Trioxvillo Torricosoco 07000 0400			N/A		
9. SPONSORING / MONITORING AGEN	NCY NAME(S) AND ADDRESS(	ES)	10. SPONSORING / MONITORING		
Defense Advanced Research Pro			AGENCY REPORT NUMBER		
3701 North Fairfax Drive		nic Parkway			
Arlington Virginia 22203-1714	Rome New	York 13441-4514	AFRL-IF-RS-TR-2006-10		
11. SUPPLEMENTARY NOTES					
AFRL Project Engineer: Christopher Flynn/IFTC/(315) 330-3249/ Christopher.Flynn@rl.af.mil					
				T	
12a. DISTRIBUTION / AVAILABILITY STATEMENT APPROVED FOR PUBLIC RELEASE; DISTRIBUTION UNLIMITED.				12b. DISTRIBUTION CODE	
13. ABSTRACT (Maximum 200 Words)				1	
The goal of performance modeling is to measure, predict, and understand the performance of a computer program or					
set of programs on a computer system. The applications of performance modeling are numerous, including evaluation					
of algorithms, optimization of code implementations, parallel library development, and comparison of system					
architectures, parallel system design, and procurement of new systems. The overall objective of this effort was to survey					
a number of DoD related applications in an effort to ascertain their needs with respect to determining what metrics exist,					
what metrics need to be developed.					
'					
14. SUBJECT TERMS			i	15. NUMBER OF PAGES	
High Performance Computing, Productivity, Benchmarking				19	
			}	16. PRICE CODE	

19. SECURITY CLASSIFICATION

**UNCLASSIFIED** 

**OF ABSTRACT** 

18. SECURITY CLASSIFICATION

**UNCLASSIFIED** 

OF THIS PAGE

NSN 7540-01-280-5500

**OF REPORT** 

17. SECURITY CLASSIFICATION

**UNCLASSIFIED** 

Standard Form 298 (Rev. 2-89) Prescribed by ANSI Std. Z39-18 298-102

20. LIMITATION OF ABSTRACT

# TABLE OF CONTENTS

SUMMARY	1
INTRODUCTION	1
METHODS, ASSUMPTIONS, AND PROCEDURES	2
INTEGRITY OF THE BENCHMARK CODE	3
RESULTS OVERVIEW	4
BENCHMARK DATA	4
RULES FOR RUNNING THE BENCHMARK	6
PROJECT'S WEBSITE	7
CONCLUSIONS	8
REFERENCES	9
APPENDIX A: BENCHMARK CODE	11
ACRONYMS	15

## **Summary**

The work for this project comprised of the following major areas:

- Provide a focused research and development program, creating new generations of high end programming benchmarks in order to realize a new vision of high end computing, high productivity computing systems (HPCS).
- Expose the issues of low efficiency, scalability, software tools and environments, and growing physical constraints.
- Architecture performance characterization of parallel systems being developed for the DAPRA High Productivity Computing Systems Program.
- Development of software for the benchmarking and performance evaluation of key components of high performance systems.
- Development of methods for guiding the collection of performance data and for analyzing and abstracting from measured performance data.
- Helping to promote this effort in the community

The objectives of this effort are:

- To establish a comprehensive set of parallel benchmarks that is generally accepted by both users and vendors of parallel systems.
- To provide a focus for parallel benchmark activities and avoid unnecessary duplication of effort and proliferation of benchmarks.
- To set standards for benchmarking methodology and result-reporting together with a control database/repository for both the benchmarks and the results.
- To make the benchmarks and results freely available in the public domain.
- To engage the high performance community in helping define the future expansion of the benchmark collection.
- To run HPC Challenge over a range of parameters.
- Collect and make available performance results in a standard web based format.
- To compute software and hardware metrics.
- Apply the run time tools being studied by the Execution Time modeling group to HPC Challenge.

#### Introduction

Unfortunately, much of the literature focuses on ad hoc approaches to evaluation of systems rather than on potential standardization of the benchmark process. If benchmarking is to mature sufficiently to meet the requirements of system architects as well as application and algorithm developers, it must address the issue of standardization.

A number of projects such as Perfect, NPB, ParkBench, and others have laid the groundwork for what we hope will be a new era in benchmarking and evaluating the

performance of computers. The complexity of these machines requires a new level of detail in measurement and comprehension of the results. The quotation of a single number for any given advanced architecture is a disservice to manufacturers and users alike, for several reasons. First, there is a great variation in performance from one computation to another on a given machine; typically the variation may be one or two orders of magnitude, depending on the type of machine. Secondly, the ranking of similar machines often changes as one goes from one application to another. So, for example, the best machine for circuit simulation may not be the best machine for computational fluid dynamics. Finally, the performance depends greatly on a combination of compiler characteristics and the human effort that was expended on obtaining the results.

## Methods, Assumptions, and Procedures

This first phase of the project developed, hardened, and reported on a number of benchmarks. The collection of tests included tests on a single processor (local) and tests over the complete system (global). Each examined performance evaluation for spatial locality and temporal locality. The tests on a local basis include DGEMM, STREAM, RandomAccess, and FFT and the tests on a global basis included High Performance Linpack, PTRANS, RandomAccess, and FFT.

The most reliable technique for determining the performance of a program on a computer system is to run and time the program (multiple times), but this can be very expensive and it rarely leads to any deep understanding of the performance issues. It is also does not provide information on how performance will change under different circumstances (e.g., scaling the problem or system parameters, or porting to a different machine).

An alternative approach to running the actual application codes is to develop a set of representative benchmark programs and to run these benchmarks on various systems with various problem and system sizes. Problems with this approach are that a quantitative analysis of the measured data is necessary to allow a deeper understanding and interpretation - i.e., abstraction - of the measured results. Statistical analysis techniques require a large amount of data to be collected. However, collecting data for all possible system and problem parameter settings is impractical. Hence, a determination needs to be

made of what and how much data needs to be collected to provide an adequate basis for sound analysis.

Another approach is to generate a model of the program and the computer system and use the model to make performance predictions, varying model parameters to simulate varying program and computer system parameters. The difficulty with this approach is in generating and validating the model. The performance of production-level application codes is a result of complex interactions between processor architecture, memory access patterns, the memory hierarchy, the communication subsystem, and the system software. Modeling each of the complex components of the system alone is a challenge. Still more challenging is the task of accurately modeling the interactions between components and the performance of complex application codes on the entire system.

Our approach in the second phase of this effort was to investigate the performance modeling problem by combining benchmarking, statistical analysis, and hierarchical modeling techniques to produce accurate models that can predict performance of complex applications on today's and tomorrow's high performance systems.

Although this work did not directly address performance engineering of complex application codes, our work laid the basis for the construction of parallel libraries that allow the reconstruction of application codes on several distinct architectures so as to assure performance portability. Once the requirements of applications are well understood, one can construct a library in a layered fashion.

The overall objective of this effort was to survey a number of DARPA related applications in an effort to ascertain their needs with respect to determining what metrics exist and what metrics need to be developed. In the course of this effort we helped in defining the metrics for future productivity, in particular:

- *Temporal data locality* measures the memory access patterns' reuse of data in CPU time domain. In other words, it measures the likelihood of a datum to be used in two close points in time.
- Spatial data locality measures the memory access patterns' reuse of data in memory address space domain. In other words, it measures the likelihood of two data being used provided that they are close to each other in memory.
- SLOC count is a simple yet very effective measure of code complexity and in turn characterizes very well the human effort involved in writing, maintaining, and refactoring a piece of code.

Using the above metrics, a set of representative application kernels were selected that reveal system performance and productivity under the workloads of varying values of the metrics so that bounds can be established for end-user applications.

# **Integrity of the Benchmark Code**

The HPCC benchmark includes existing and well known benchmark codes as well as not so well known codes that were not intended for benchmarking by their authors. In both cases one may argue that it is possible to obtain HPCC-equivalent functionality by running each of the included tests separately or some subset thereof. Based on our extensive experience in high performance benchmarking, utilization of the entire suite, up to this point, offers as complete an analysis of benchmarking as has ever been done. There are a few important reasons why performing individual or subset tests would be neither practical nor complete:

- 1. Uniform verification Each code was examined and (as necessary) was augmented with a robust verification procedure that ensures numerical correctness of the result. This is in sharp contrast to traditional forms of benchmarking that only focus on best performance (or best time).
- 2. Reasonable optimization In the hands of a skillful benchmarking engineer, each of HPCC's individual tests alone can be optimized beyond any skillful user's comprehension. Such scenario is made unlikely with an HPCC framework that

encapsulates all the tests in a single runtime thus excluding the possibility of switching the tested system into a special mode that would only benefit a single test. Another contribution of HPCC is the transfer of knowledge from the benchmarking engineer to the user as the optimization techniques are meant to be disclosed by the party submitting results.

3. Convenience and correctness Running each of HPCC's tests separately requires manual effort which is cumbersome, costly and error prone if done in a robust and reliable manner. HPCC eliminates this by automating the process of gathering performance data on widely applicable hardware characteristics.

#### **Results Overview**

As a result of this project, software was developed in an open source mechanism and distributed to the community via the normal channels for open source software – a publicly available web page is used for downloading stable releases of the software while read-only CVS access may be used for development snapshots. Occasionally, the source code was distributed via email if other means were inaccessible. There was a monthly phone call and/or Access Grid meetings of participants to exchange ideas and progress as well as an electronic mailing list to assist with participant communication. Finally, the lead participants participated in face-to-face meetings as needed, and there has been at least one such meeting annually.

The problem area may be characterized by most common memory access patterns and is defined by seven benchmarks: HPL, DGEMM, STREAM, PTRANS, RandomAccess, FFT, and Latency/Bandwidth:

- 1. HPL is the Linpack Toward Peak Performance (TPP) benchmark. The test stresses the floating point performance of a system.
- 2. DGEMM measures the floating point rate of execution of double precision real matrix-matrix multiplication.
- 3. STREAM is a benchmark that measures sustainable memory bandwidth (in GB/s) of simple vector application kernels.
- 4. PTRANS (from the ParkBench suite) measures the rate of transfer for large arrays of data between multiprocessor's memories.
- 5. RandomAccess measures the rate of integer updates of random memory locations.
- 6. FFT measures the floating point rate of execution of double precision complex onedimensional Discrete Fourier Transform (DFT).
- 7. Latency/Bandwidth measures (as the name suggests) latency and bandwidth of communication patterns of increasing complexity between as many nodes as is timewise feasible.

#### **Benchmark Data**

To ensure broad impact and scientific value of the benchmark suite, results from a vast array of data is collected for each submission. The data is gathered in a database that has

read-only public access. The data in the database can be divided into the following categories:

- CPU parameters such as floating-point execution rate (measured in Gflop/s) of various computational kernels
- Memory subsystem parameters such as data transfer rates (measured in GB/s) for various CPU workloads and memory bus sharing scenarios
- Communication subsystem parameters such as transfer rates (measured in GB/s) across the system interconnect and message latencies (measured in micro-seconds)
- Hardware, software, and productivity optimizations including complete description of the hardware configuration, software environment and tools that were used to produce the executable, and all the specific changes applied to the optimized run.

## **Benchmark Optimization and Result Database**

An integral part of HPCC is the database that stores various optimization techniques applicable to the HPCC tests as well as the results of applying these optimizations. All of the data is time stamped and consistently gathered from every system submitted to the HPCC website. As such, it constitutes invaluable resource for both hardware and software vendors as well as application vendors. The optimization portion of the database stores two types of information:

- 1. Hardware/software optimization This portion includes reports on how the programming environment and system libraries influence hardware and its performance.
- 2. Productivity optimization This part of the database shows how the human factor is included in the overall system design. In particular the result submitters describe changes made for the optimized run of the benchmark. Based on this information, conclusions may be drawn about feasibility and actual performance gains for end-applications.

The results portion of the database includes various computer system parameters gathered during benchmark run. In particular, the data may be divided into three groups:

#### 1. Processor parameters

These include floating-point execution rates for computational kernels such as global linear equation solving, local matrix multiplication and local/global FFT. Numerical capabilities of the processor are noted as well by measuring relevant numerical norms that assess correctness and quality of the delivered solution.

## 2. Memory parameters

These include transfer rates of multiple sorts that show performance of the simplest data movement scenarios (CPU-memory transfer) and more elaborate schemes that involve multiple CPU calculations combined with simultaneous accesses to multiple memory modules.

#### 3. Interconnect parameters

Essentially, two types of parameters are considered: latency and bandwidth. But the measurement scenarios used to obtain them vary greatly from the simple polling-driven

scheme with only two interconnect end-points exchanging data in a synchronous fashion to network-capacity, limited tests of raw communication and computation-interleaved probes that rely on communication system throughput and tolerance of high volume traffic.

## **Rules for Running the Benchmark**

The HPCC rules ensure integrity of the benchmark code when run repeatedly on the user system by requiring a wide range of data to provide exhaustive information about the system used for benchmarking and conditions under which the run took place. Due to the fact that the HPCC benchmark is already being used in procurement cycles at many supercomputing centers, we maintain the rules and make them available at the web site. The rules are included here verbatim:

There must be one baseline run submitted for each computer system entered in the archive. There may also exist an optimized run for each computer system.

- 1. Baseline Runs: Optimizations as described below are allowed.
  - 1. Compile and load options Compiler or loader flags which are supported and documented by the supplier are allowed. These include porting, optimization, and preprocessor invocation.
- 2. Libraries Linking to optimized versions of the following libraries is allowed:
  - 1. BLAS
  - 2. MPI Acceptable use of such libraries is subject to the following rules:
- 3. All libraries used shall be disclosed with the results submission. Each library shall be identified by library name, revision, and source (supplier). Libraries which are

not generally available are not permitted unless they are made available by the reporting organization within six months.

- 1. Calls to library subroutines should have equivalent functionality to that in the released benchmark code. Code modifications to accommodate various library call formats are not allowed.
- 2. Only complete benchmark output may be submitted partial results will not be accepted.

#### 2. Optimized Runs

- 1. Code modification Provided that the input and output specification is preserved, the following routines may be substituted:
  - 1. In HPL: HPL\_pdgesv(), HPL\_pdtrsv() (factorization and substitution functions)
  - 2. no changes are allowed in the DGEMM component
  - 3. In PTRANS: pdtrans()

- 4. In STREAM: tuned\_STREAM\_Copy(), tuned\_STREAM\_Scale(), tuned\_STREAM\_Add(), tuned\_STREAM\_Triad()
- 5. In RandomAccess: MPIRandomAccessUpdate() and RandomAccessUpdate()
- 6. In FFT: fftw\_malloc(), fftw\_free(), fftw\_create\_plan(), fftw\_one(), fftw\_destroy\_plan(), fftw\_mpi\_create\_plan(), fftw\_mpi\_local\_sizes(), fftw\_mpi(), fftw\_mpi\_destroy\_plan() (all these functions are compatible with FFTW 2.1.5 so the benchmark code can be directly linked against FFTW 2.1.5 by only adding proper compiler and linker flags, e.g. -DUSING\_FFTW)
- 7. In Latency/Bandwidth component alternative MPI routines might be used for communication. But only standard MPI calls are to be preformed and only to the MPI library that is widely available on the tested system.

## 2. Limitations of Optimization

- 1. Code with limited calculation accuracy The calculation should be carried out in full precision (64-bit or the equivalent). However the substitution of algorithms is allowed (see Exchange of the used mathematical algorithm).
- 2. Exchange of the used mathematical algorithm Any change of algorithms must be fully disclosed and is subject to review by the HPC Challenge Committee. Passing the verification test is a necessary condition for such an approval. The substituted algorithm must be as robust as the baseline algorithm. For the matrix multiply in the HPL benchmark, Strassen Algorithm may not be used as it changes the operation count of the algorithm.
- 3. Using the knowledge of the solution Any modification of the code or input data sets, which uses the knowledge of the solution or of the verification test, is not permitted.
- 4. Code to circumvent the actual computation Any modification of the code to circumvent the actual computation is not permitted.

# **Project's Website**

In order to provide easy access to the results of this project a publicly available web site was developed. The website can be accessed at <a href="http://icl.cs.utk.edu/hpcc/">http://icl.cs.utk.edu/hpcc/</a> (the site has nearly 2000 visitors per month and has been used to download the benchmark code by almost 1000 visitors). It consists of the following components:

- Rules for running the benchmark and reporting results.
- News item from external media outlets.
- Download page that allows to download the benchmark code in various forms and versions.
- Frequently Asked Questions has an extensive list of questions frequently encountered in benchmarking and pertaining to the HPCC Suite.
- Resource page with (mostly external) links related to the benchmark suite.
- Pages with sponsors and collaborators that made the project possible.

- Web form for submitting information about tested system and the output of the benchmark.
- Database read-only interface that allows users to interactively obtain various views of the submitted data or export the contents of the database for archiving or more thorough analysis on user system.

The entire contents of the website, including the source code (in PDF format) for all seven releases of the benchmark suite, have been placed on a CD accompanying this report.

#### **Conclusions**

The impact of this work on the community is the availability of an easy mechanism to test, evaluate and compare high productivity systems. The applications of performance modeling are numerous, including evaluation of algorithms, optimization of code implementations, parallel library development, comparison of system architectures, parallel system design, and procurement of new systems.

The main components of the HPC Challenge Benchmark Suite are based on existing codes that are well known and used in the HPC community. This fact greatly contributes to wider adoption of our effort. In addition, our framework combines these existing codes together in a unique way by defining very specific rules about the conditions under which they should be run and some of the included tests are used in new scenarios. We also largely expanded on the benchmark deployment and results data to facilitate fairness of performance assessment.

#### References

- 1. Alice E. Koniges, Rolf Rabenseifner and Karl Solchenbach: "Benchmark Design for Characterization of Balanced High-Performance Architectures," In IEEE Computer Society Press, www.computer.org/proceedings/, *Proceedings of the 15th International Parallel and Distributed Processing Symposium (IPDPS'01)*, Workshop on Massively Parallel Processing (WMPP), April 23-27, 2001, San Francisco, USA.
- 2. Rolf Rabenseifner and Alice E. Koniges: "Effective Communication and File-I/O Bandwidth Benchmarks," In J. Dongarra and Yiannis Cotronis (Eds.), *Recent Advances in Parallel Virtual Machine and Message Passing Interface, Proceedings of the 8th European PVM/MPI Users' Group Meeting, EuroPVM/MPI 2001*, Santorini, Greece, Sep. 23-26, LNCS 2131, pp 24-35.
- 3. Jack Dongarra, Piotr Luszczek, and Antoine Petitet: "The LINPACK Benchmark: Past, Present, and Future," *Concurrency and Computation: Practice and Experience* 15(9):803-820, August 2003, ISSN 1532-0634.
- 4. John D. McCalpin, STREAM: Sustainable Memory Bandwidth in High Performance Computers. <a href="http://www.cs.virginia.edu/stream/">http://www.cs.virginia.edu/stream/</a>
- 5. Antoine Petitet, R. Clint Whaley, Jack Dongarra, Andy Cleary, HPL A Portable Implementation of the High Performance Linpack Benchmark for Distributed-Memory Computers, <a href="http://www.netlib.org/benchmark/hpl/">http://www.netlib.org/benchmark/hpl/</a>
- 6. PARKBENCH PARallel Kernels and BENCHmarks, <a href="http://www.netlib.org/parkbench/">http://www.netlib.org/parkbench/</a>
- 7. Jack Dongarra and Piotr Luszczek: "Introduction to the HPC Challenge Benchmark Suite," *Computer Science Department Technical Report 2005*, UT-CS-05-544, University of Tennessee Knoxville.
- 8. Stephen Shankland. "Supercomputer ranking method faces revision", Published June 18, 2004. CNET News.com, <a href="http://news.com/supercomputer+ranking+method+faces+revision/2100-7337\_3-5238405.html?tag=nefd.lede">http://news.com/supercomputer+ranking+method+faces+revision/2100-7337\_3-5238405.html?tag=nefd.lede</a>.
- 9. Jan Stafford. "Cray CTO: Supercomputers outshine Linux clusters in HPC, Part 1", Published August 24, 2004. SearchEnterpriseLinux.com, <a href="http://searchenterpriselinux.techtarget.com/originalContent/0,289142,sid39\_gci1000889,00.html">http://searchenterpriselinux.techtarget.com/originalContent/0,289142,sid39\_gci1000889,00.html</a>
- 10. Mark Hachman. "Alternative Supercomputer Metrics Sought", Published November 8, 2004. eWEEK.com, http://www.eweek.com/article2/0,1759,1720493,00.asp.
- 11. Christopher Lazou. "HPC Benchmarks: Going for Gold in a Computer Olympiad?", Published January 21, 2005. HPCwire, http://www.tgc.com/hpcwire/hpcwireWWW/05/0121/109098.html

12. "Cray XD1 Supercomputer Outscores Competition in HPC Challenge Benchmark Tests; Benchmarks Assess Real-World Performance in Several Key Aspects of Supercomputing", published February 14, 2005. BusinessWire <a href="http://home.businesswire.com/portal/site/google/index.jsp?ndmViewId=news\_view&newsId=20050214005533&newsLang=en">http://home.businesswire.com/portal/site/google/index.jsp?ndmViewId=news\_view&newsId=20050214005533&newsLang=en</a>

# **Appendix A: Benchmark Code**

The initial public release of the benchmark included over 40,000 lines of C code, which makes it impractical to provide as text in this report. However, the accompanying CD contains the complete code source in both compressed and uncompressed formats. Instead, a compact reference implementation is included in this report that gives a flavor of the actual implementation. The reference implementation is written in a popular scripting language called Python.

```
1. HPL – Linpack reference implementation
  import numarray, time
  import numarray.random_array as naRA
  import numarray.linear algebra as naLA
  n = 1000
  a = naRA.random([n, n])
  b = naRA.random([n, 1])
  t = -time.time()
  x = naLA.solve linear equations(a, b)
  t += time.time()
  r = numarray.dot(a, x) - b
  r = numarray.maximum.reduce(abs(r))
  print t, 2.0e-9 / 3.0 * n**3 / t
  print r n, r_n / (n * 1e-16)
2. DGEMM reference implementation
  import numarray, time
  import numarray.random array as naRA
  n = 1000
  a = naRA.random([n, n])
  b = naRA.random([n, n])
  c = naRA.random([n, n])
  alpha = a[n/2, 0]
  beta = b[n/2, 0]
  t = -time.time()
  c = beta * c + alpha * numarray.dot(a, b)
  t += time.time()
  print t, 2e-9 * n**3 / t
3. STREAM reference implementation
  import numarray, time
  import numarray.random_array as naRA
  import numarray.linear algebra as naLA
  m = 1000
  a = naRA.random([m, 1])
  alpha = naRA.random([1, 1])[0]
 Copy, Scale = "Copy", "Scale"
 Add, Triad = "Add", "Triad"
  td = \{ \}
```

```
td[Copy] = -time.time()
      c = a[:]
      td[Copy] += time.time()
      td[Scale] = -time.time()
      b = alpha * c
      td[Scale] += time.time()
      td[Add] = -time.time()
      c = a * b
      td[Add] += time.time()
      td[Triad] = -time.time()
      a = b + alpha * c
      td[Triad] += time.time()
      for op in (Copy, Scale, Add, Triad):
          t = td[op]
          s = op[0] in ("C", "S") and 2 or 3
          print op, t, 8.0e-9 * s * m / t
4. PTRANS reference implementation
   import numarray, time
   import numarray.random_array as naRA
   import numarray.linear_algebra as naLA
   n = 1000
   a = naRA.random([n, n])
   b = naRA.random([n, n])
   t = -time.time()
   a = numarray.transpose(a)+b
   t += time.time()
   print t, 8e-9 * n**2 / t
5. RandomAccess reference implementation
  from time import time
  from numarray import *
  m = 1024
  table = zeros([m], UInt64)
  ran = zeros([128], UInt64)
  mupdate = 4 * m
  POLY, PERIOD = 7, 1317624576693539401L
  def ridx(arr, i, tmp):
   tmp[0:1] = arr[i:i+1]
    if tmp.astype(Int64)[0] < 0:
    tmp <<= 1
    tmp ^= POLY
    else:
    tmp <<= 1
 def starts(n):
    n = array([n], Int64)
```

```
m2 = zeros([64], UInt64)
while n[0] < 0: n += PERIOD
while n[0] > PERIOD: n = PERIOD
if n[0] == 0: return 1
temp = array([1], UInt64)
ival = array([0], UInt64)
for i in range(64):
m2[i] = temp[0]
ridx(temp, 0, ival)
ridx(temp, 0, ival)
   for i in range(62, -1, -1):
   if ((n>>i) & 1)[0]: break
   ran = array([2], UInt64)
   while (i > 0):
   temp[0] = 0
   for j in range(64):
       if ((ran>>j) \& 1)[0]:
         temp ^= m2[j:j+1]
       ran[0] = temp[0]
       i = 1
       if ((n>>i) & 1)[0]:
         ridx(ran, 0, ival)
return ran[0]
ival = array([0], UInt64)
t = -time()
for i in range(m): table[i] = i
for j in range (128):
    ran[j] = starts(mupdate / 128 * j)
for i in range(mupdate / 128):
    for j in range(128):
       ridx(ran, j, ival)
       table[ran[i] & (m-1)] \stackrel{\wedge}{=} ran[i]
 t += time()
 temp = array([1], UInt64)
 for i in range(mupdate):
     ridx(temp, 0, ival)
     table[temp \& (m - 1)] ^= temp
 temp = 0
 for i in range(m):
     if table[i] != i: temp += 1
 print t, 1e-9 * mupdate / t, 100.0*temp/m
```

6. FFT reference implementation import numarray, numarray.fft, time, math

```
import numarray.random_array as naRA m = 1024 re = naRA.random([m, 1]) im = naRA.random([m, 1]) a = re + 1.0j * im t = -time.time() b = numarray.fft.fft(a) t += time.time() r = a - numarray.fft.inverse_fft(b) r_n = numarray.maximum.reduce(abs(r)) r_n = numarray.maximum.reduce(abs(r))
```

## Acronyms

Explanation of acronyms used in this report:

- CPU Central Processing Unit
- CSCS Swiss Center for Scientific Computing
- CVS Concurrent Versions System
- DARPA The Defense Advanced Research Projects Agency
- DFT Discrete Fourier Transform
- DGEMM Double-precision General Matrix-Matrix multiply
- FFT Fast Fourier Transform
- FFTE an FFT code written in Fortran
- FFTW an FFT code written in C
- HPCC High Performance Computing Challenge Benchmark Suite
- HPCS High Productivity Computing Systems
- HPL High Performance Linpack benchmark
- Linpack LINear PACKage: a set of Fortran subroutines for numerical linear algebra; also a benchmark based on one of the Linpack subroutines
- MPI Message Passing Interface
- NPB NAS Parallel Benchmarks
- PARKBENCH PARallel Kernels and BENCHmarks
- PTRANS Parallel matrix TRANSpose
- PVM Parallel Virtual Machine
- RandomAccess formerly known as GUPS benchmark
- SLOC Source Line of Code
- STREAM sustainable memory bandwidth test